

# Image Dataset Curation and Art Recommendation

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**Berlin Computer Vision Group**  
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**KI** Service  
Zentrum  
by Hasso-Plattner-Institut

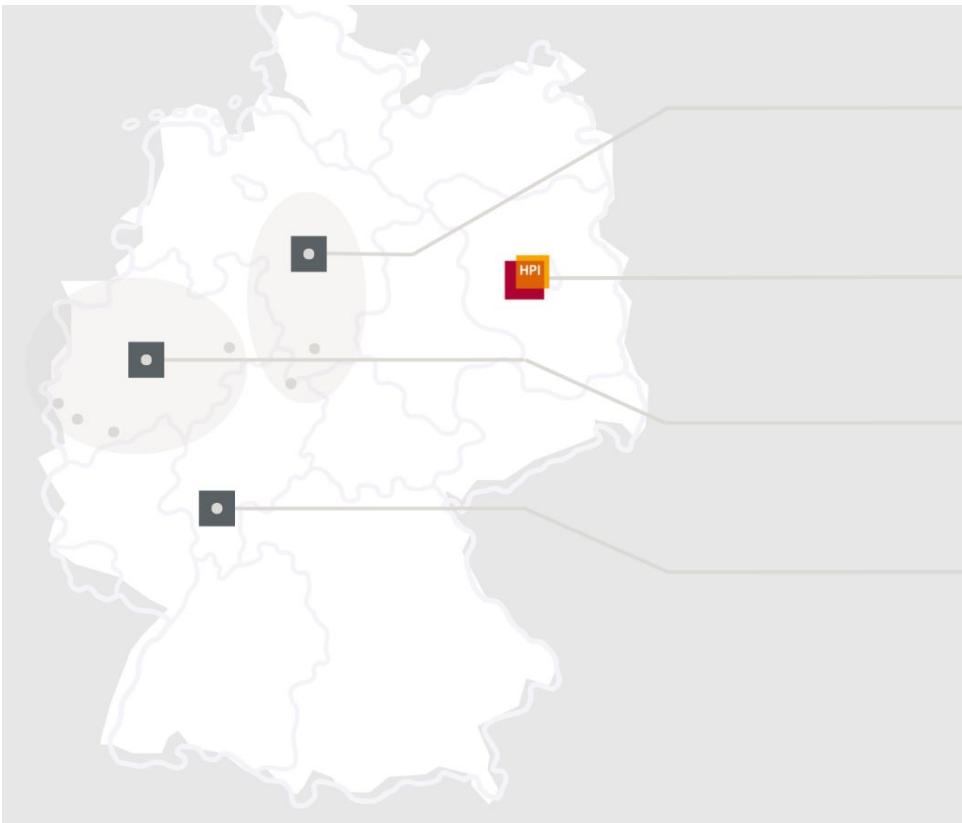


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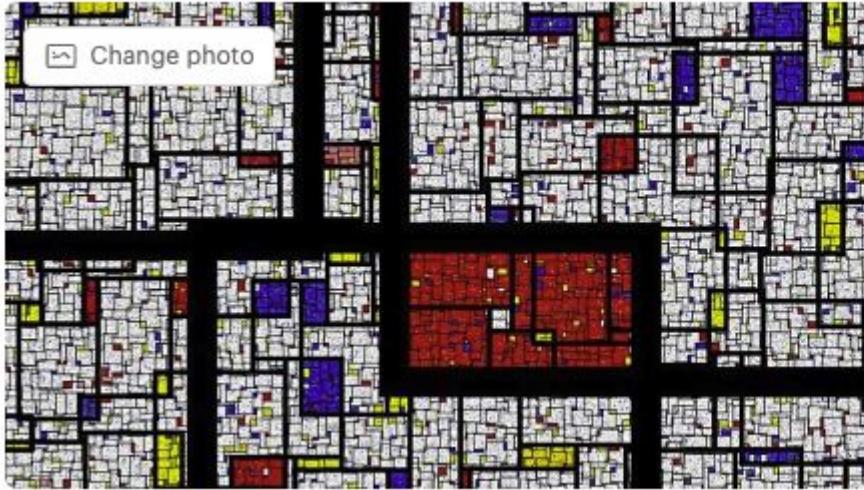
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## Berlin Computer Vision Group

★★★★★ (81)

Berlin, Germany

848 members · Public group

Organized by Antonio Rueda Toicen

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<https://www.meetup.com/berlin-computer-vision-group/>

# Agenda

- Brief intro and learning objectives
- Use cases for image similarity
- Scraping images from Google Images or Bing
- Setting up Google Colab and Drive
- Understanding image embeddings
- Using pre-trained networks for image similarity
- K-nearest neighbors for dataset exploration
- Image clustering with K-medoids
- Visualizing embeddings with TensorBoard
- Transfer learning for image classification
- Review questions and discussion

# What we expect you to have

- Some Python knowledge
- Curiosity :)

# Learning objectives

At the end of this workshop you will be able to:

- Describe use cases for image similarity in dataset curation
- Scrape images from Google Images or Bing
- Generate embeddings for images using a pretrained neural network (Resnet)
- Compare images using cosine similarity
- Cluster images using k-medoids
- Visualize embeddings in 3D using Tensorboard
- Classify images using a pre-trained Resnet

# How are we doing this workshop

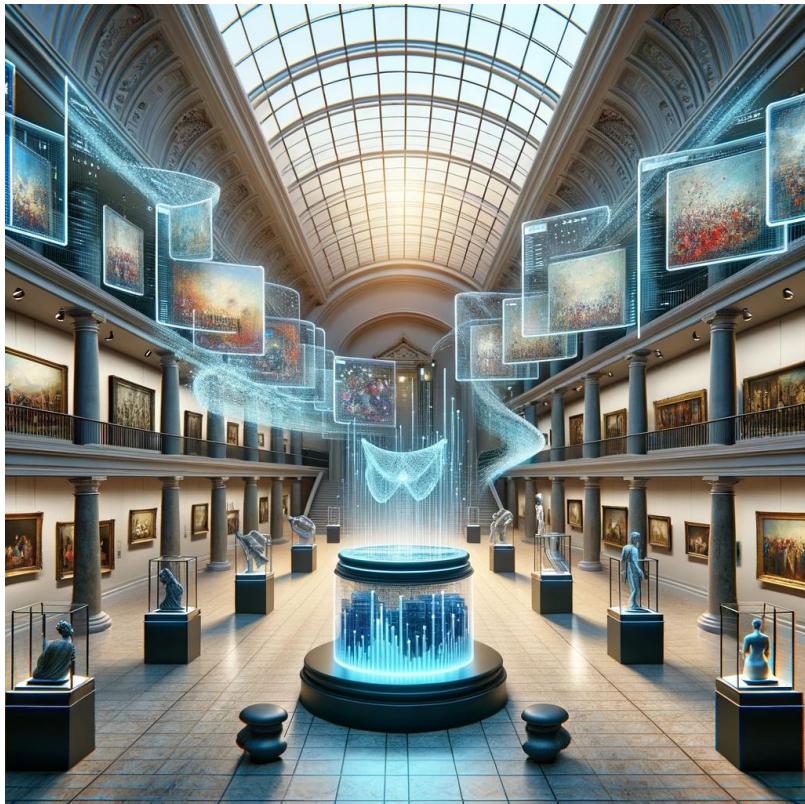
- We pick an artist
- We scrape their images from Google Images through Javascript (just run the script)
- We **type** most of the Python code from the tutorial notebooks in Google Colab

Repository: <https://github.com/andandandand/image-dataset-curation>

# What you need

- A Google user account
- A Google Drive account with enough free space
- Google Chrome or Firefox

# What is dataset curation?



- We want to make data **accurate** and **relevant**
- We clean, deduplicate, and label
- This is similar to what museum curators do

# How similar are these two images?



Cosine similarity = 0.91

# How similar are these two images?



Cosine similarity = 0.78

# How similar are these two images?



Cosine similarity = 0.53

# How similar are these two images?



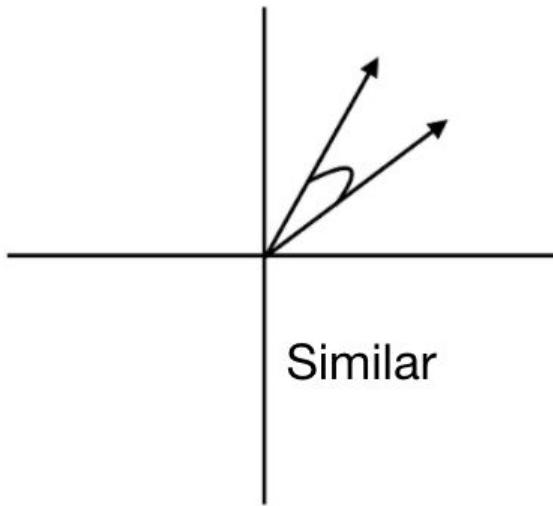
Cosine similarity = 0.65

# How similar are these two images?

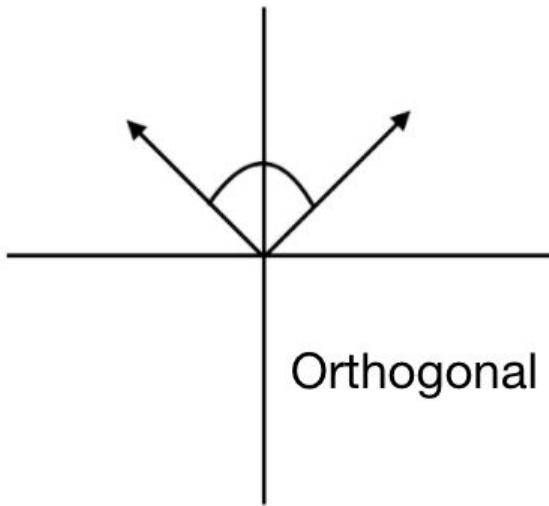


Cosine similarity = 0.84

# Cosine Similarity



Similar



Orthogonal

16

$$\text{similarity} = \cos(\theta) = \frac{\mathbf{A} \cdot \mathbf{B}}{\|\mathbf{A}\| \|\mathbf{B}\|}$$

Time for the first notebook

Comparing apples to apples

# Use Case: Google's reverse image search

Google

Find image source

Search Text Translate

Related search

The Tower of Babel

Wikimedia  
File:Pieter Bruegel d. Ä.  
075.jpg - Wikimedia...

See exact matches >

Genially  
La Tour de Babel par Lila et Suzanne

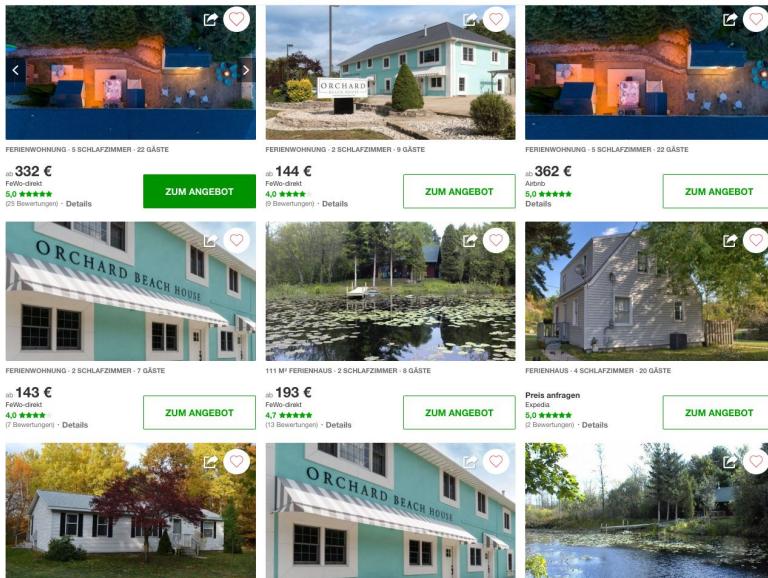
HistoryExtra  
Babylon: What Happened To The...

Christian Bible Refe...  
The Tower of Babel

<https://images.google.com/>

# Use case: image matching at hometogo.com

- Inventory understanding (500 million images)
- Providing the best deals to users (sample use case: strike prices)



3-STAR HOTEL · DOWNTOWN GRAND LAS VEGAS

\$30 ~~\$33~~  
Travelocity  
4.2 ★★★★★ · Details

[VIEW DEAL](#)

# Use case: primary image matching at Hometogo



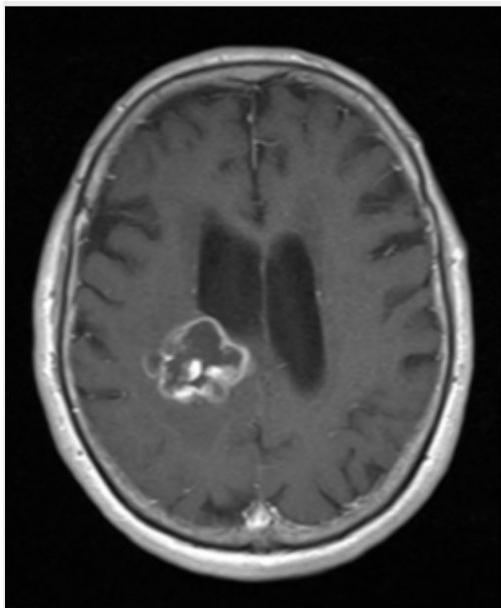
**Cosine similarity = 0.65**

# Use case: primary image matching at Hometogo

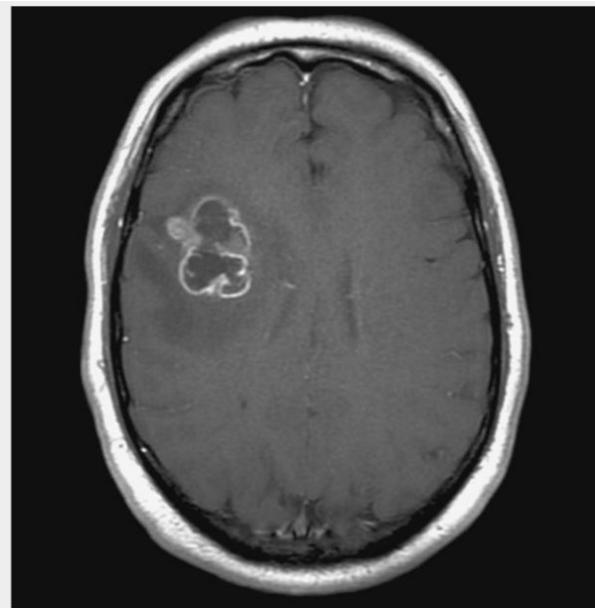


**Cosine similarity = 0.99**

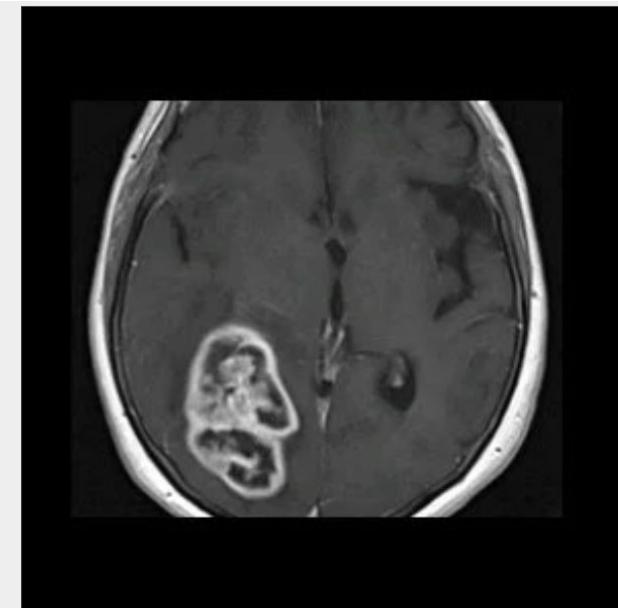
# Use case: differential diagnosis



Glioma grade I



Glioma grade I



Glioma grade III

# Use case: bike trip routing

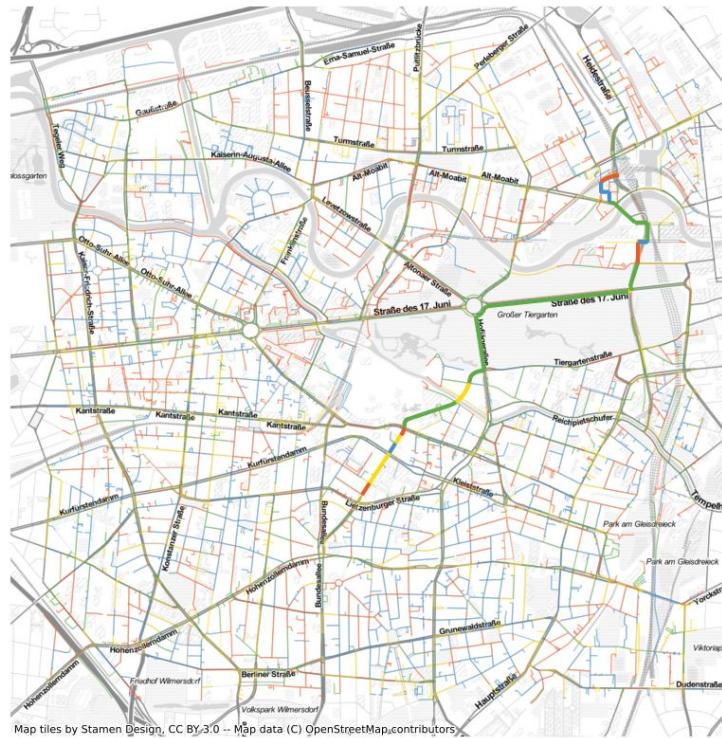
Cluster 0: Safe bike lanes



Cluster 1: Unsafe bike lanes



# Use case: bike trip routing



[www.github.com/graumannm/Berlin\\_Bike\\_CV](https://www.github.com/graumannm/Berlin_Bike_CV)

# Use case: cleaning image datasets



<https://github.com/cleanlab/cleanlab>

# Art Recommendation system

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This is the repository of a portfolio project at DSR. This project aims to identify similar images using pre-trained computer vision networks. For an explanation of the technology see the [technology section](#).

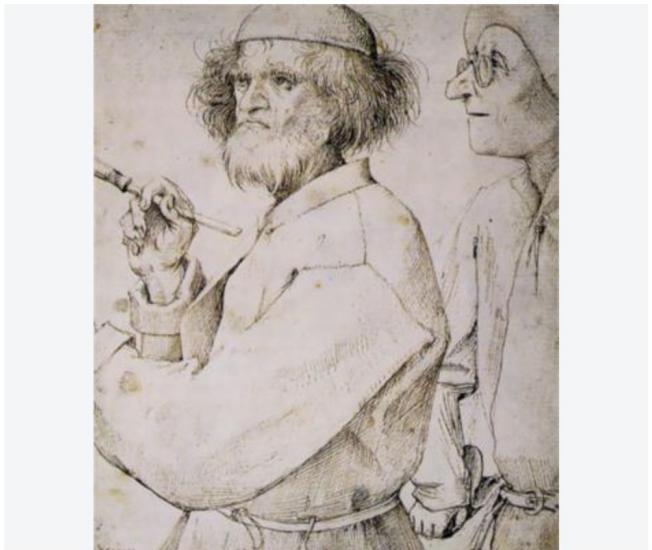
## Contributors

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- Catarina Ferreira
- Gargi Maheshwari

<https://github.com/gargimaheshwari/Wikiart-similar-art>

# Motivation: enhancing Wikiart's recommendations



The Painter and the Art Lover - Pieter Bruegel the Elder

## Pieter Bruegel the Elder

Pieter Brueghel de Oude

Born: c.1525; Breda, Netherlands (i)

Died: September 9, 1569; Brussels, Belgium (i)

Nationality: Flemish

Art Movement: Northern Renaissance

Painting School: Flemish School, Antwerp School

Genre: genre painting

Field: [painting](#), printmaking

Influenced by: Hieronymus Bosch

Influenced on: Tobias Verhaecht, Peter Paul Rubens, Jan Miense Molenaer, Hendrick Avercamp

Art institution: Guild of Saint Luke

Friends and Co-workers: Maarten de Vos, Giulio Clovio

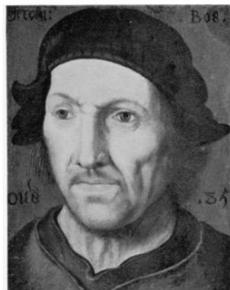
Family and Relatives: Jan Brueghel the Elder, Pieter Brueghel the Younger

Wikipedia: [en.wikipedia.org/wiki/Pieter\\_Bruegel\\_the\\_Elder](https://en.wikipedia.org/wiki/Pieter_Bruegel_the_Elder) ↗

<https://www.wikiart.org/en/pieter-bruegel-the-elder>

# Motivation: improving Wikiart's art recommendation

## RELATED ARTISTS i



**Hieronymus Bosch**



**Gregorio Lopes**



**Marinus van  
Reymerswaele**  
c.1490 - c.1546



**Hans Holbein the  
Younger**  
c.1497 - 1543



**Giulio Clovio**  
1498 - 1578



**Jan van Hemessen**  
c.1500 - c.1566



**Cristovao de  
Figueiredo**  
c.1500 - c.1543

<https://www.wikiart.org/en/pieter-bruegel-the-elder>

# Motivation: improving Wikiart's art recommendation

## ARTISTS BY ART MOVEMENT

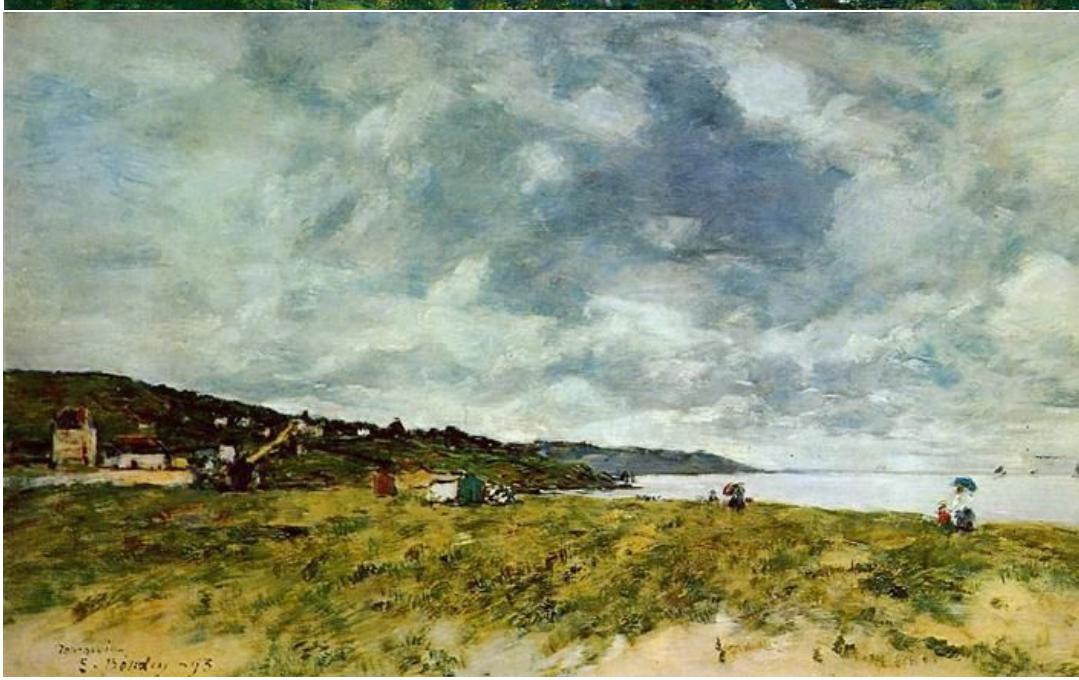
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Art historians employ a number of ways to group world arts into systems of classification. They subdivide the continuous flow of artworks through time and space into groupings. These groupings are defined by the perception that the artworks within them share a single quality or a set of qualities that are significant. Significant qualities reflect a specific approach of an artist; they can include the formal, stylistic, iconographic, thematic, or other aspects of art. The definition of a grouping reflects judgments about the nature of meaningful connections between artworks, and between art and its larger context. Western arts are usually structured by art movements, using mostly cultural and aesthetic criteria, while Eastern arts are subdivided into periods according to political-dynastic markers.

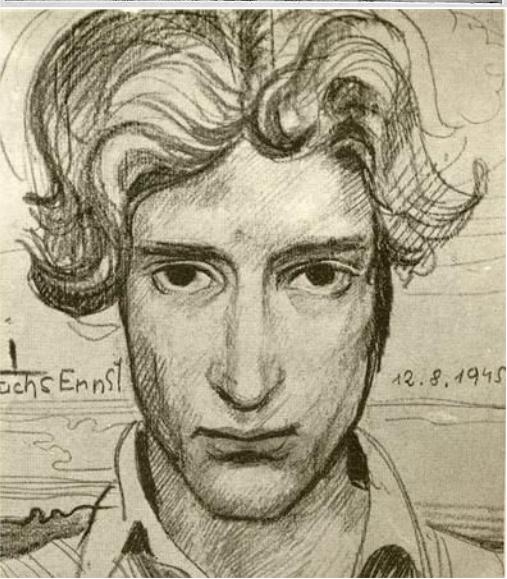
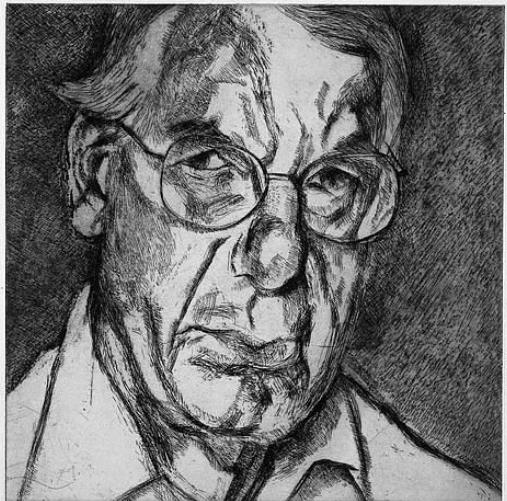
by time

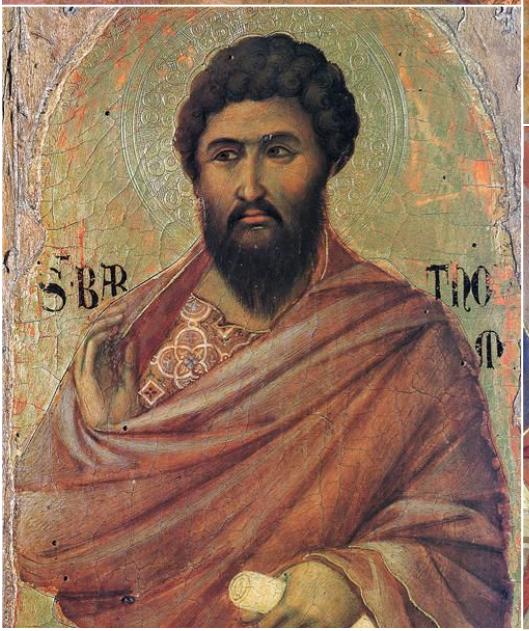
by name

by count

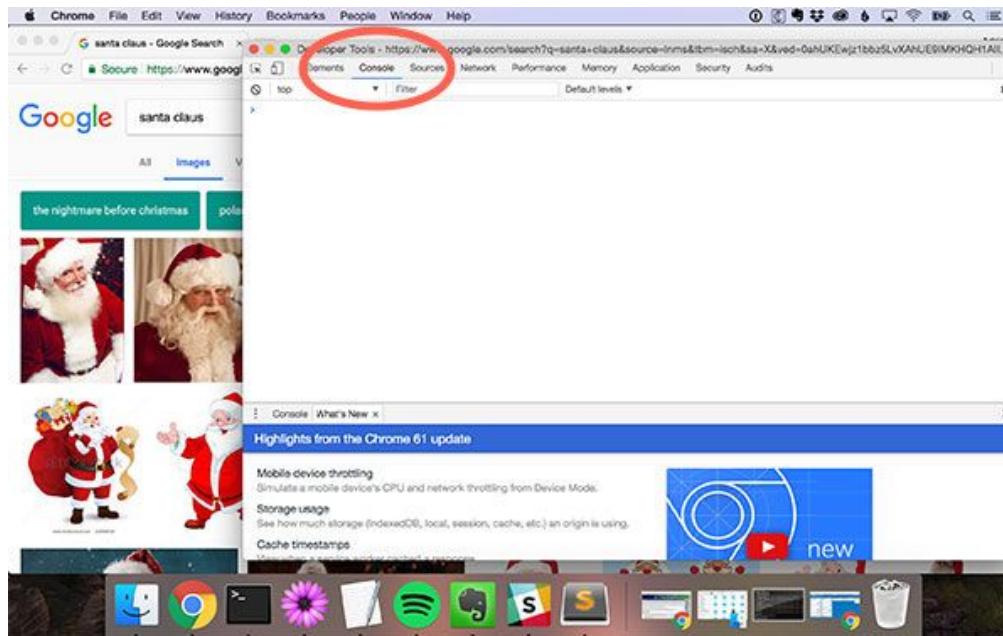






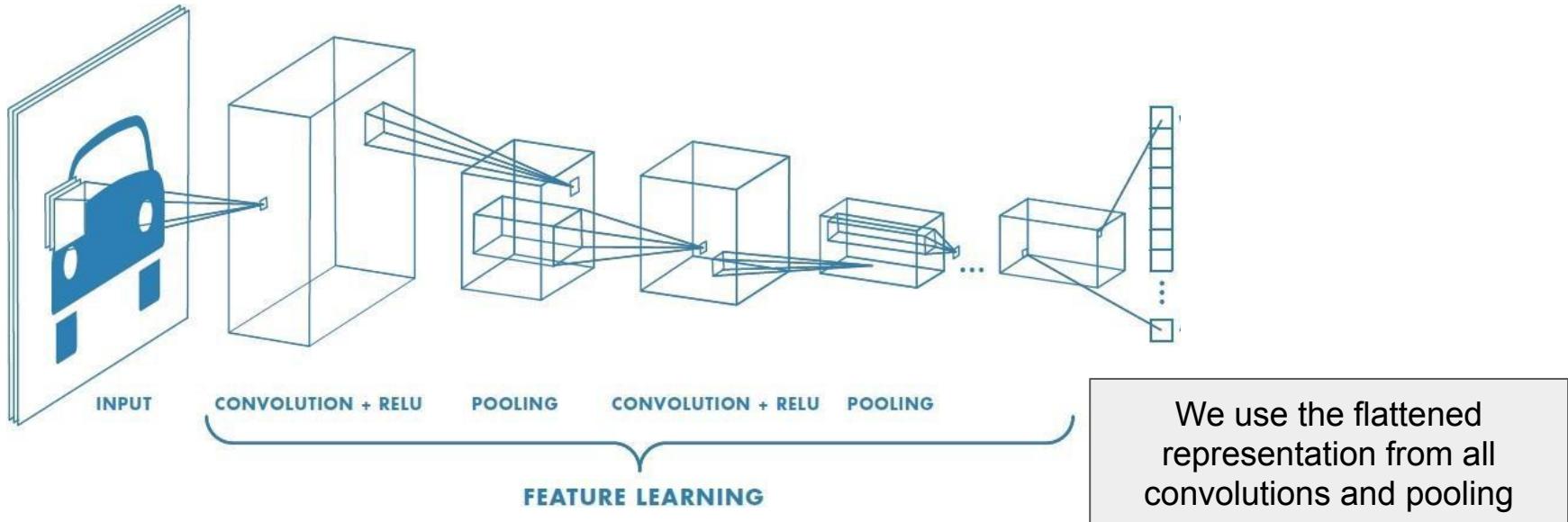


# Scraping a dataset from Google Images

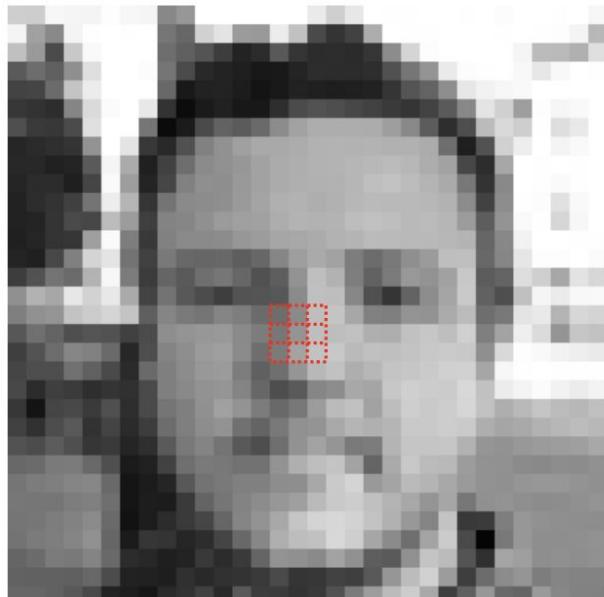


[PylImageSearch guide](#)

# Image Embeddings from Convolutional Networks



# Intuitions about convolutions



input image

$$\left( \begin{array}{ccc} 110 & + & 139 & + & 191 \\ \times 0 & & \times -1 & & \times 0 \\ \\ + & 120 & + & 149 & + & 191 \\ \times -1 & & \times 5 & & \times -1 \\ \\ + & 124 & + & 164 & + & 195 \\ \times 0 & & \times -1 & & \times 0 \\ \\ = & 131 \end{array} \right)$$

kernel:



output image

<https://setosa.io/ev/image-kernels/>

# The ImageNet dataset



14,197,122 images, 21841 synsets indexed

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**ImageNet** is an image database organized according to the **WordNet** hierarchy (currently only the nouns), in which each node of the hierarchy is depicted by hundreds and thousands of images. The project has been **instrumental** in advancing computer vision and deep learning research. The data is available for free to researchers for non-commercial use.

<https://www.image-net.org/>

# Image neighborhoods

1.0



0.73



0.73



0.72



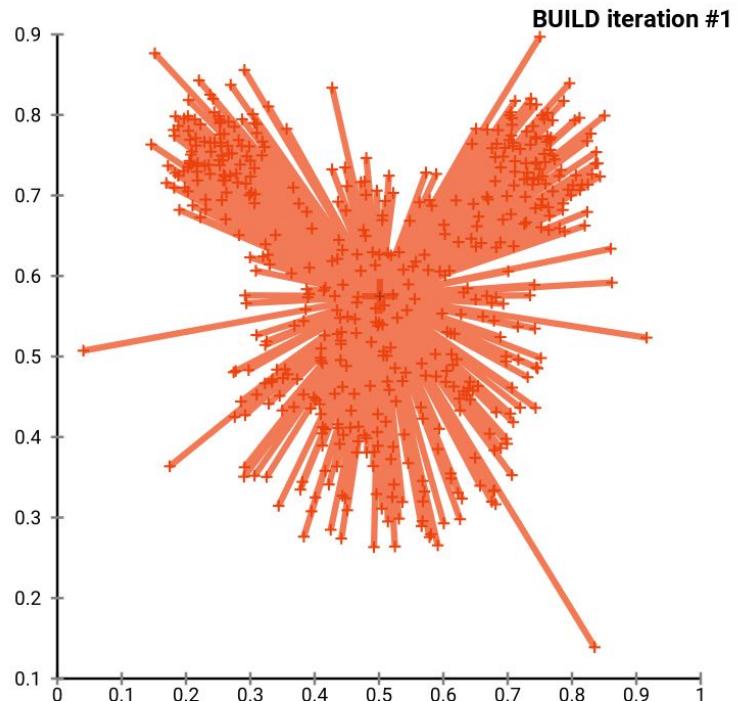
0.7



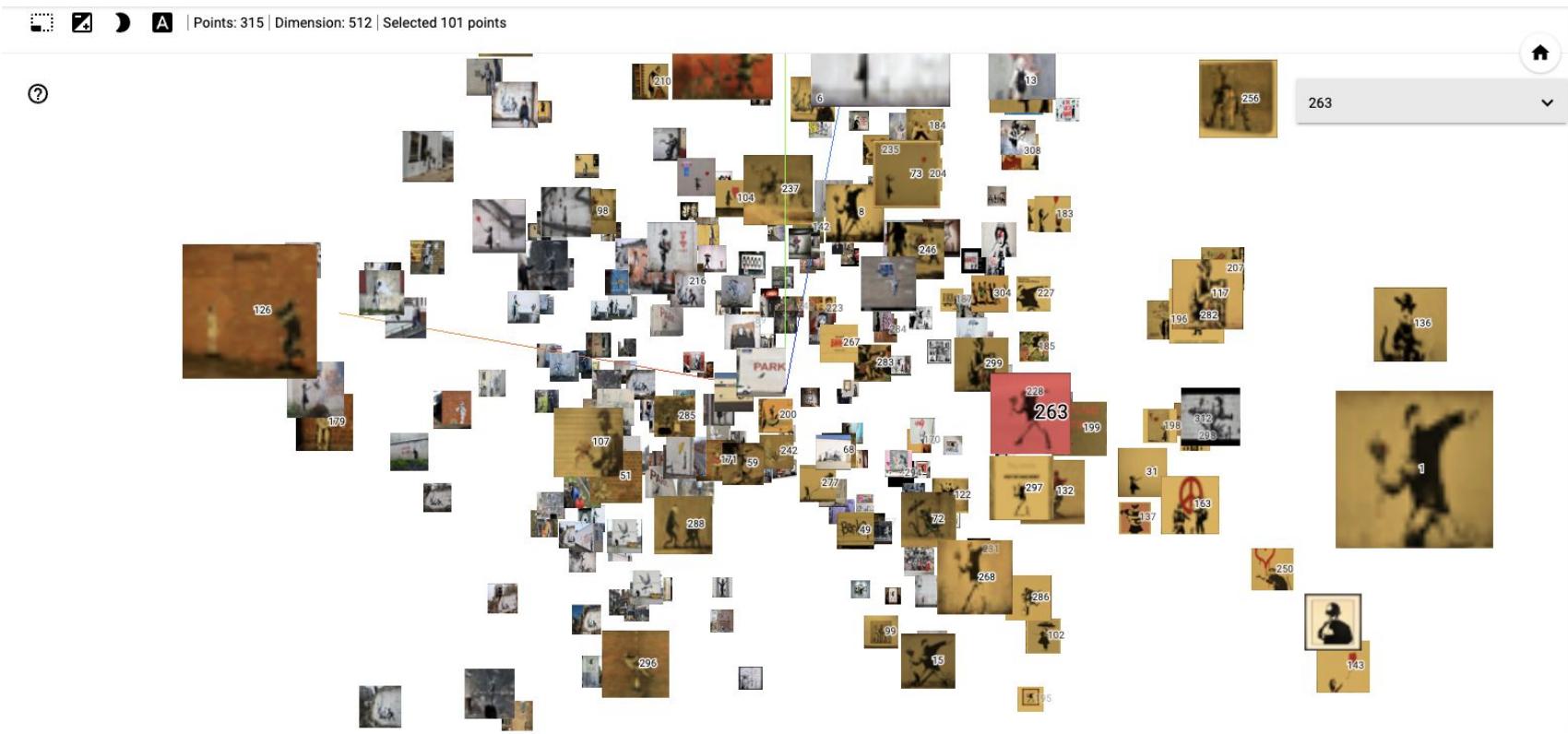
0.7



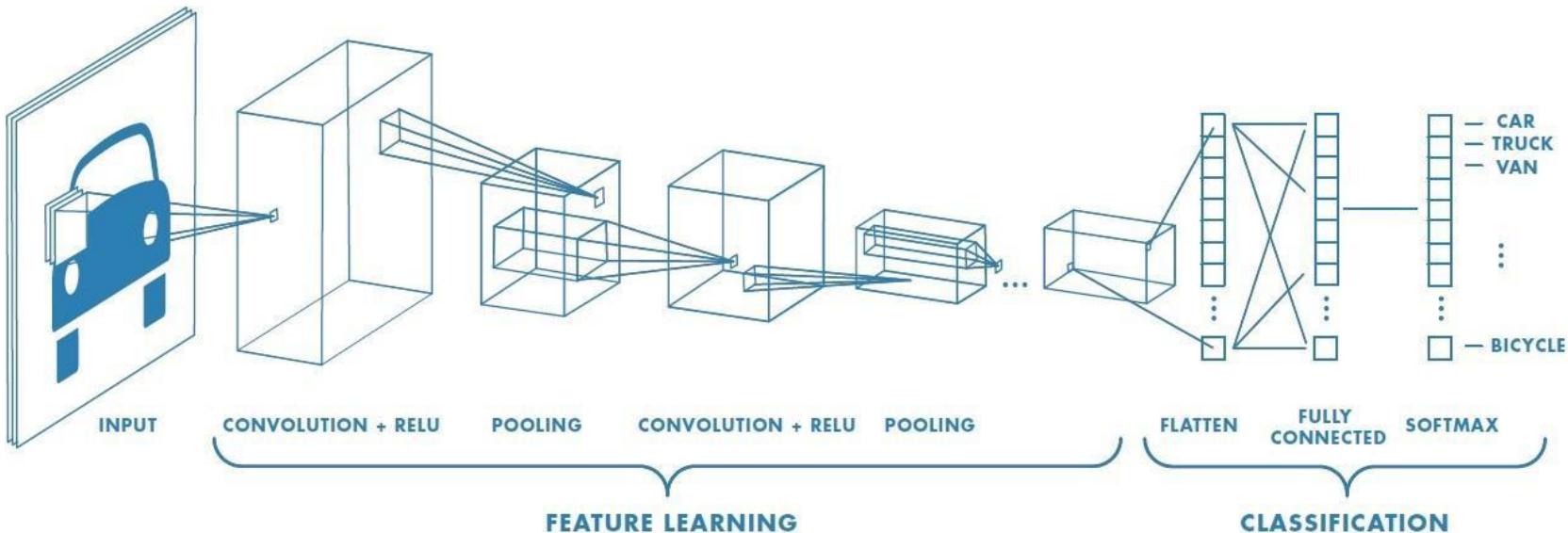
# K-medoids clustering



# Visualizing embeddings in TensorBoard



# Image classification through transfer learning



# Review questions

- How can we access an image array from its file's url?
- What is an embedding?
- What is maximum possible value of cosine similarity between two vectors?
- What's the cosine similarity between two orthogonal vectors?
- How does the k-medoids algorithm work?
- What is transfer learning?
- What is Imagenet?

# Join us for the next workshops!

- [AI Service Center - Berlin Brandenburg](#)
- [Berlin Computer Vision Group](#)

## Next topics:

- Fine tuning models for image classification
- Image analysis with CLIP
- Meta's Segment Anything
- Segmentation and object detection with Detectron
- Model deployment with FastAPI and Docker